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# Possible improvements of the method of fundamental solution to solve the ECGI problem



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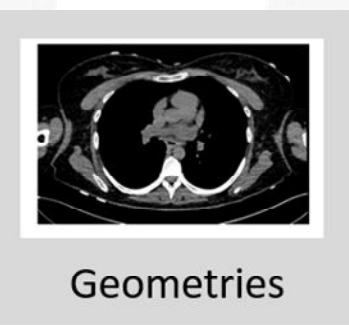
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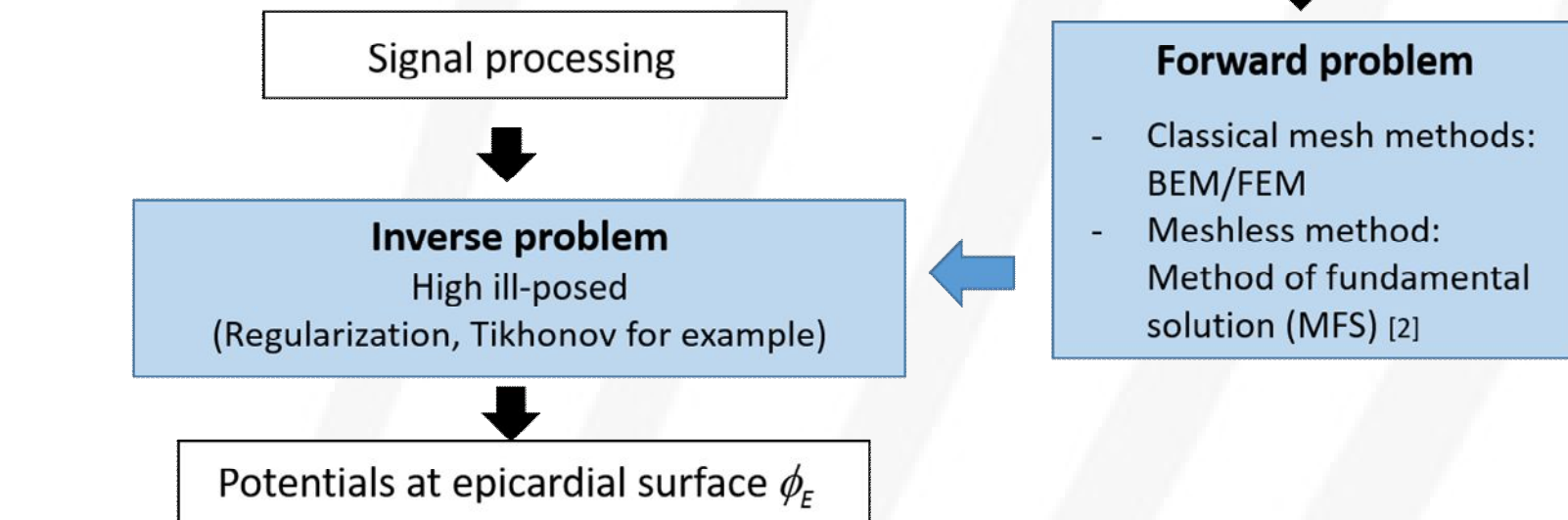


## Introduction

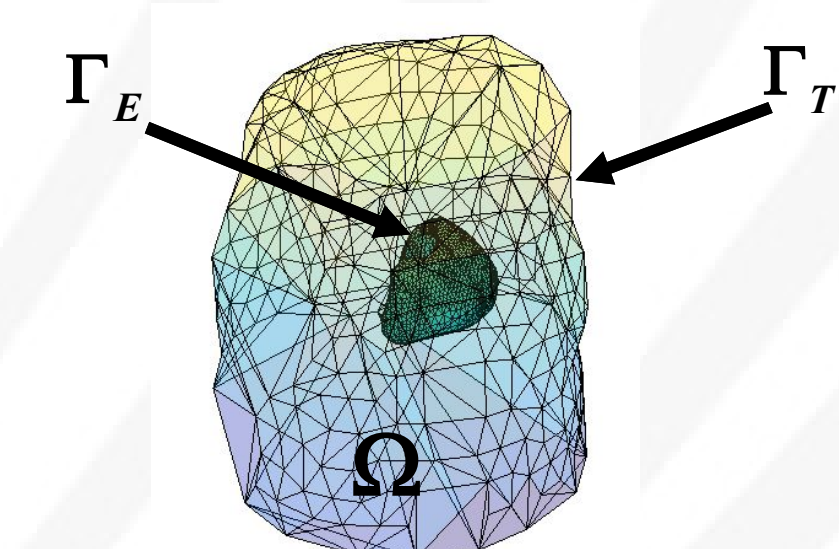


➤ Despite all the success of ECGI, the understanding and treatment of many cardiac diseases is not feasible yet without an improvement of the inverse problem solution.

➤ Can we improve the forward problem to make the inverse problem less ill-conditioned?



➤ Robust calculations of the inverse ECGI problem may require accurate specification of **boundary conditions** at the torso and cardiac surfaces [1].



$-\text{div}(\phi)$ , in  $\Omega$ . Under:

Dirichlet conditions:  $\phi = \phi_T$  on  $\Gamma_T$

Homogeneous Neumann conditions:  $\partial_n \phi = 0$  on  $\Gamma_T$

The aim of the inverse problem is to find  $\phi = \phi_E$  on  $\Gamma_E$

Geometrical meshes used: The body is cut at the top and bottom of the torso and the arms.

➤ The classical formulation of the ECGI inverse problem with the method of fundamental solution (MFS) involves a linear system [2].

## Study of Boundary conditions

➤ The MFS matrix can be split in two matrices:

$$\begin{bmatrix} \text{Dirichlet Conditions } B_0 \\ \text{Homogeneous Neumann Conditions (HNC) } B_1 \end{bmatrix} \begin{bmatrix} f(\|x_1 - y_1\|) & \dots & f(\|x_1 - y_M\|) \\ \vdots & \ddots & \vdots \\ f(\|x_N - y_1\|) & \dots & f(\|x_N - y_M\|) \\ \frac{\partial f(\|x_1 - y_1\|)}{\partial n} & \dots & \frac{\partial f(\|x_1 - y_M\|)}{\partial n} \\ \vdots & \ddots & \vdots \\ \frac{\partial f(\|x_N - y_1\|)}{\partial n} & \dots & \frac{\partial f(\|x_N - y_M\|)}{\partial n} \end{bmatrix} \begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_M \end{bmatrix} = \begin{bmatrix} \phi_T(x_1) \\ \vdots \\ \phi_T(x_N) \\ 0 \\ \vdots \\ 0 \end{bmatrix}$$

$$x_i \in \Gamma_T, y_j \in \hat{\Gamma}_T \cup \hat{\Gamma}_E$$

$$f(\|x_i - y_j\|) = \frac{1}{4\pi\|x_i - y_j\|}$$

$$\phi_E(x) = a_0 + \sum_{j=1}^M a_j f(\|x - y_j\|)$$

$$x \in \Gamma_E, y_j \in \hat{\Gamma}_T \cup \hat{\Gamma}_E$$

➤ We can remark that:

- The contribution of the submatrices  $B_1$  and  $B_0$  in the whole solution is related to their respective norms.
- Due to the meshing of the torso, non-physiological conditions are applied to the top, bottom of the torso and the arms.
- Accurate computation of the normals at torso surface is required.

**Do we need to enforce the homogeneous Neumann conditions in the MFS inverse problem?**

• To evaluate the contribution of both **boundary conditions**:

$J_\lambda(a) = \frac{1}{2} \left( (1-\lambda)^2 \|B_0 a - \phi_T\|_2^2 + \lambda \|B_1 a\|_2^2 + \alpha \|a\|_2^2 \right)$ , for  $\lambda = 0$  (MFS without HNC) and  $\lambda = 0.5$  (Standard MFS) (4)

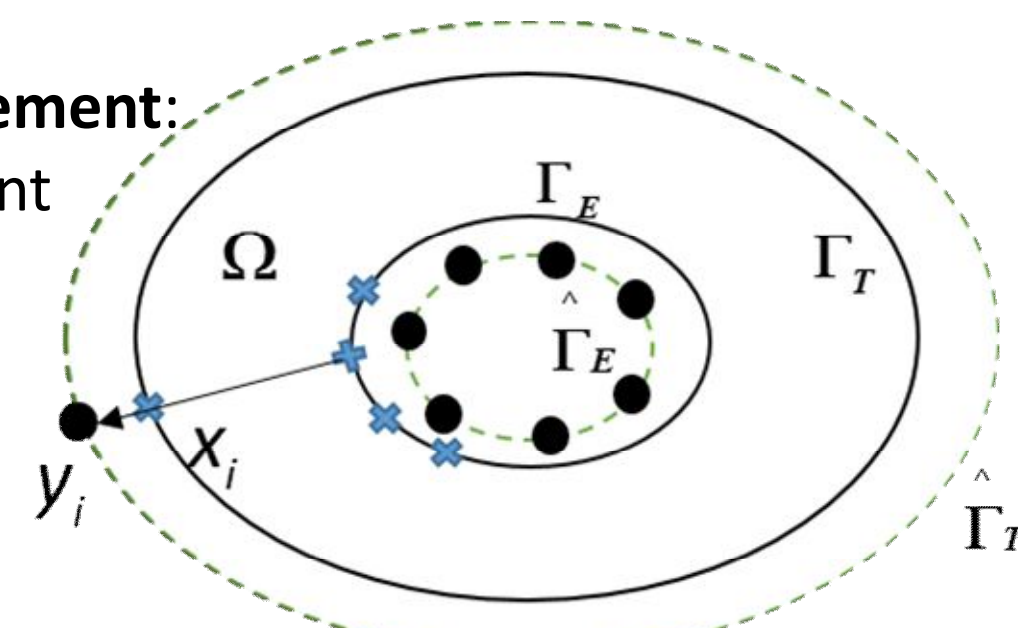
The solution of (4) was found by using Tikhonov regularization and  $\alpha$  was chosen by using Creso method as in [2].

## Study of placement of virtual sources

- In other fields it has been shown that the ill-posedness of MFS problem and the efficacy of its solution depends on **the placement of the virtual sources** [3].
- The center of the heart used in [2] to inflate the torso surface (in order to place its respective virtual sources) can be a misfit reference, for example when structural diseases are present.

➤ Therefore, we studied **the effect of changing the torso virtual placement**:

- For each electrode on the torso, we find the location of closest point on the heart surface  $h_{d_{\min}}$  s.t.  $d_{\min} = \min(\|x_i - h_k\|_2), k=1, \dots, M_H$
- We construct the location of virtual source  $y_i$  related to the torso electrode  $x_i$  as  $y_i = x_i + R_T(x_i - h_{d_{\min}})$
- We use SVA to find the ratio  $R_T$  that makes our problem better Conditioned, i.e. that improves the SV decay.



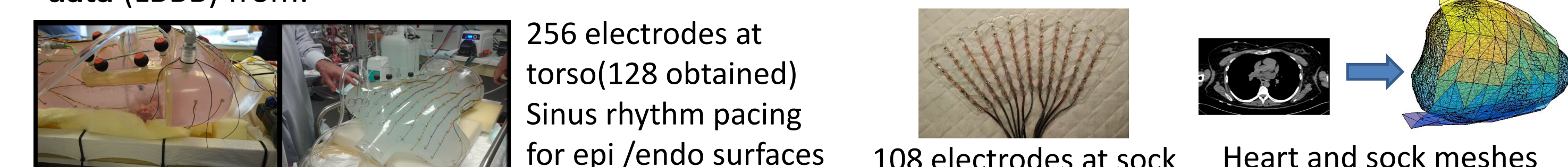
## Method of evaluation

➤ To test the effect of HNC – **Five activation patterns** (1 single site pacing and 4 single spiral waves) **were simulated** using [4]:

- The currents from the monodomain problem are used to compute the BSPM. The simulations provide both the theoretical, *in-silico*  $\phi_T$  and  $\phi_E$  every 1ms.
- $\phi_T$  were computed by solving a static bidomain problem in a realistic, heterogeneous torso model.

➤ To test the ill-posedness of the problem with standard and new **distribution of sources** – **Real data** from a patient presenting scar was employed.

➤ To compare the four combinations: Standard MFS, Standard MFS without HNC, MFS with new distribution of sources, and MFS with new distribution of sources and without HNC – **Experimental data** (LBBB) from:



## Results

➤ **Study of Boundary conditions: Respective contribution of  $B_0$  and  $B_1$**

- The  $\varepsilon = \|B_1\| / \|B_0\|$  depends only on the geometry and location of sources (for which we used a fixed rule defined in [2]). We found  $\varepsilon = 0.0013$ , indicating predominance of  $B_0$  compared to  $B_1$  in the standard MFS.

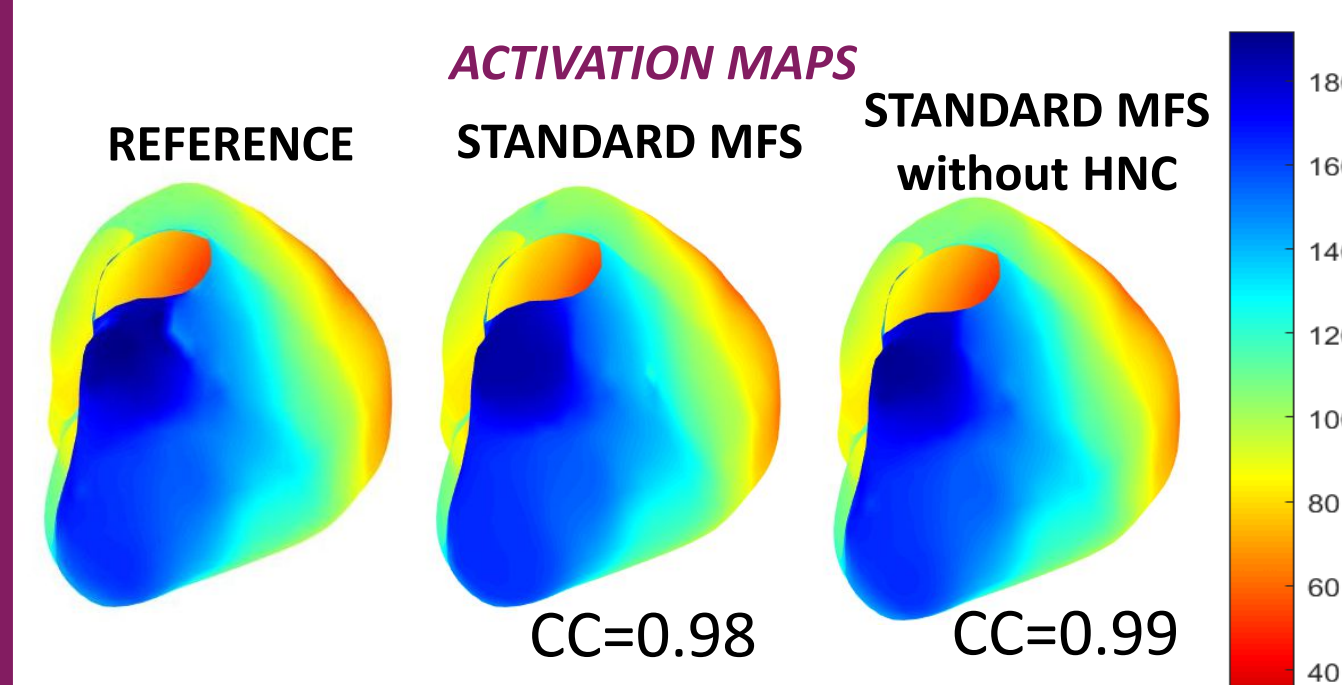


Figure 1. Activation maps for electrograms, single site pacing.

| COMPARISON OF ELECTROGRAMS |                |        |                |                |        |                |
|----------------------------|----------------|--------|----------------|----------------|--------|----------------|
|                            | CC             |        |                | RE             |        |                |
|                            | Q <sub>1</sub> | Median | Q <sub>3</sub> | Q <sub>1</sub> | Median | Q <sub>3</sub> |
| STANDARD MFS               | 0,999          | 0,999  | 0,999          | 0,020          | 0,034  | 0,054          |
| STANDARD MFS without HNC   | 0,989          | 0,995  | 0,998          | 0,071          | 0,107  | 0,152          |

Table 1. CC and RE for electrograms, five simulations.

➤ **Study of the effect of changing the torso virtual sources placement**

- The new distribution of torso virtual sources reduces the ill-posedness of the problem

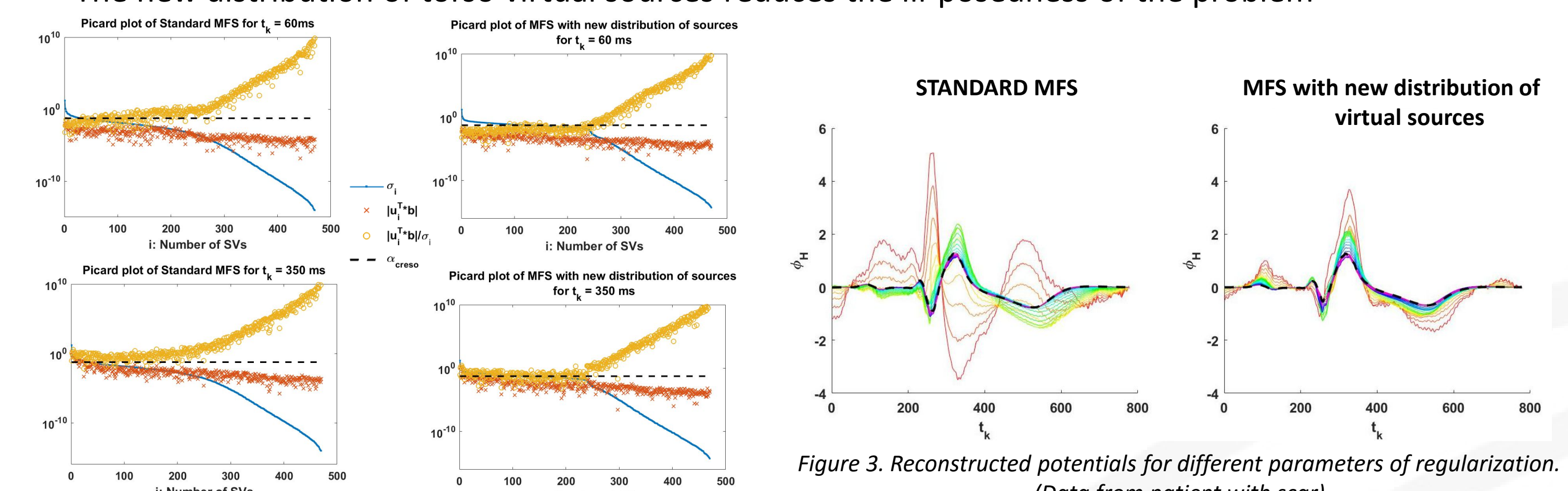


Figure 2. DPC plot of standard MFS against MFS with new distribution of sources for two instances of time different. (Data from patient with scar)

➤ **Combining the effect of changing the placement of virtual sources in the torso with the effect of HNC**

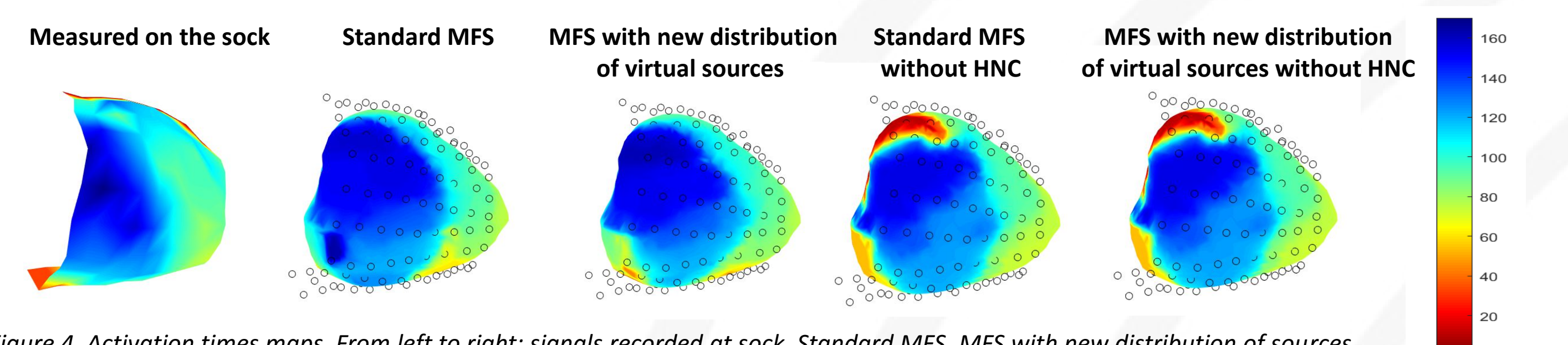


Figure 4. Activation times maps. From left to right: signals recorded at sock, Standard MFS, MFS with new distribution of sources, Standard MFS without HNC, MFS with new distribution of sources and without HNC.

| COMPARISON OF ATs          |      |      |
|----------------------------|------|------|
|                            | CC   | RE   |
| STANDARD MFS               | 0,57 | 0,37 |
| STANDARD MFS, NO HNC       | 0,66 | 0,34 |
| MFS with NEW DIST.         | 0,61 | 0,35 |
| MFS with NEW DIST., NO HNC | 0,58 | 0,38 |

Table 2. CCs and REs for ATs maps above (figure 4).

| COMPARISON OF ELECTROGRAMS |                |        |                |                |        |                |
|----------------------------|----------------|--------|----------------|----------------|--------|----------------|
|                            | CC             |        |                | RE             |        |                |
|                            | Q <sub>1</sub> | Median | Q <sub>3</sub> | Q <sub>1</sub> | Median | Q <sub>3</sub> |
| STANDARD MFS               | 0,32           | 0,41   | 0,68           | 0,54           | 0,78   | 1,03           |
| STANDARD MFS, NO HNC       | 0,28           | 0,5    | 0,77           | 0,57           | 0,75   | 0,96           |
| MFS with NEW DIST.         | 0,24           | 0,49   | 0,75           | 0,58           | 0,74   | 0,95           |
| MFS with NEW DIST., NO HNC | 0,29           | 0,55   | 0,78           | 0,38           | 0,61   | 0,61           |

Table 3. CCs in the interval (beat) outlined by the orange box and REs for potentials below (figure 5).

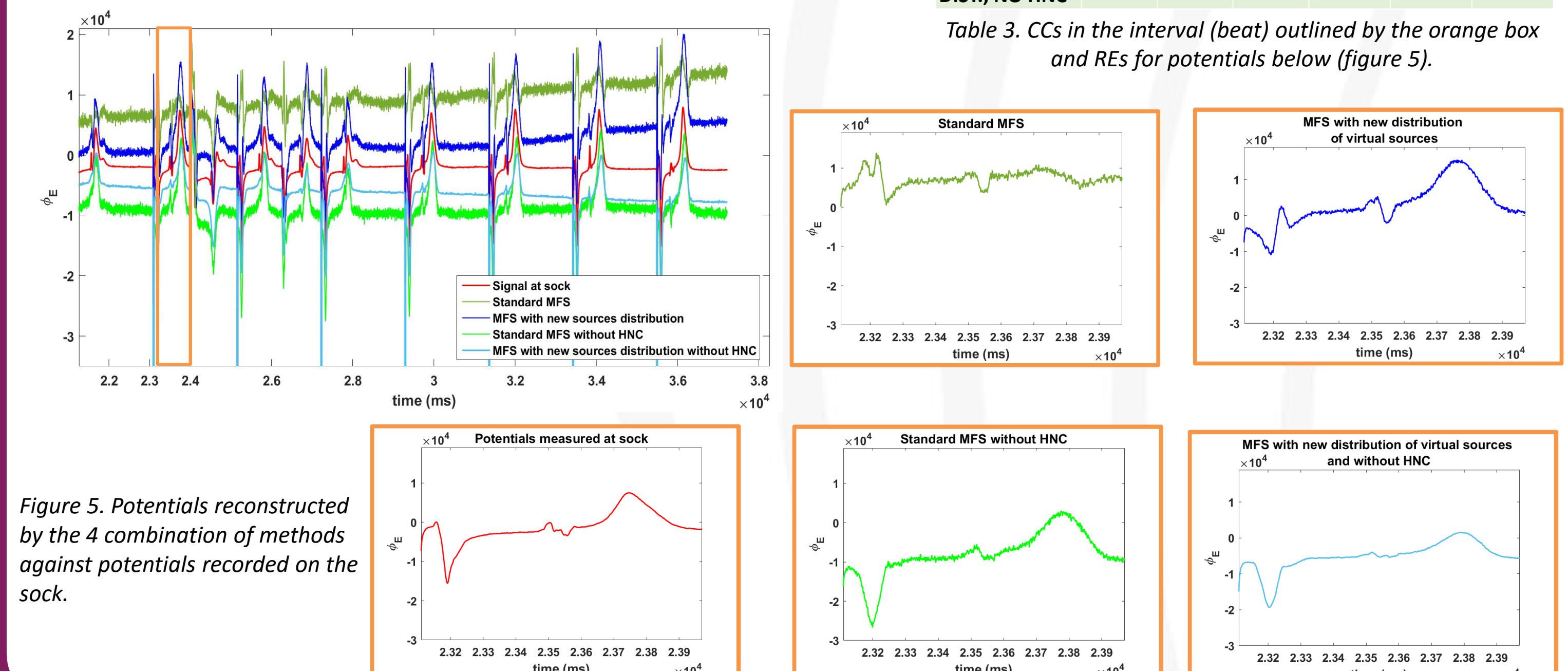


Figure 5. Potentials reconstructed by the 4 combination of methods against potentials recorded on the sock.

## Conclusions

- Removing the Neumann conditions reduces the forward and inverse computational cost.
- MFS with new distribution of sources made the problem less ill-conditioned and less sensitive to the choice of the regularization parameter.
- The HNC are related with the small SVs, i.e. with higher frequencies, this can be seen in the respective noisy reconstructed potentials.
- MFS with new distribution of virtual sources and without HNC has better CC and less REs. However, the REs are still high. This indicates that a good similarity of the potential pattern is achieved but not a good amplitude. Finally, best ATs maps were achieved by standard MFS without HNC.
- Future work: The amplitude can be improved with better choice of the regularization parameter according to the distance of the virtual sources and/or by using spatio-temporal regularization.

## Acknowledgements

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